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# Optimization of Electronically Scanned Conformal Antenna Array Synthesis Using Artificial Neural Network Algorithm

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HAMDI Bilel<sup>(1,2)</sup>

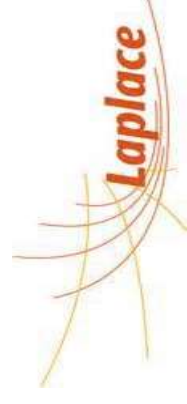
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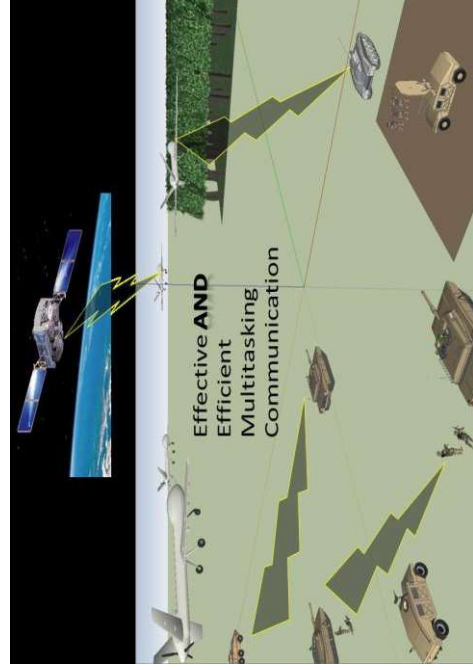
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# Abstract

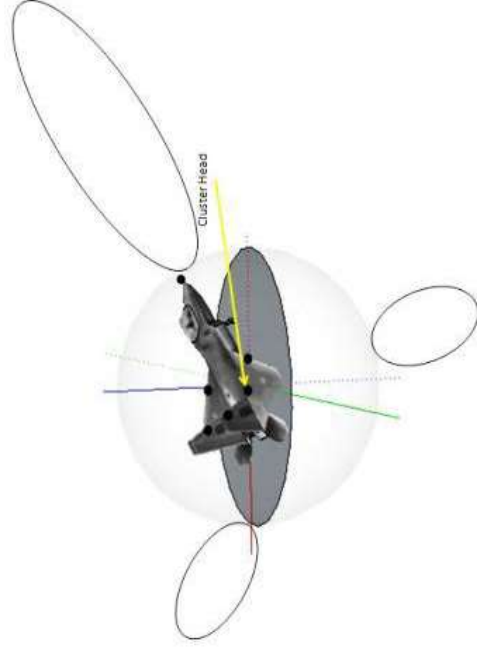
Studying of mechanical steerable antennas has been considered the subject of feature research. In order to reduce the cost of the mechanical system and to grow up the steering capabilities of the radar, we suggest replacing any mechanical antenna components with an electronically controlled 3D or conformal antennas arrays. 3D antenna arrays can be easily produced with existing manufacturing technologies and offer a considerable advantages in terms of 3-D steerable radiation beam, size, directivity, HPBW and SLL reduction. In this paper, we have developed the neural networks method based beamforming that will be applied to the array pattern synthesis for three-dimensional (3D) conformal antenna arrays. This approach permits to model and optimize the antenna arrays system, by acting on many parameters of the array and taking into account predetermined general criteria.

The goal is then to build a feed-forward neural network with supervised learning that approximates the following array pattern's function. It explains how to introduce the basic principles of artificial neural network (ANN), some fundamental networks are examined in detail for their ability to solve simple pattern synthesis problem in conformal antenna arrays. This fact increases the complexity of the problem under consideration and fitting the neural network model, such as training function, architecture and parameter that would improve and result more accuracy about input-output relations. Then, the used neural technique proved its effectiveness in improving performance using the known conformal isotropic antenna arrays.

# Regular 3D and Conformal Phased Array Antennas



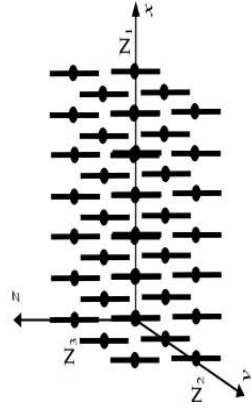
**Distributed beamforming in the battlefield**



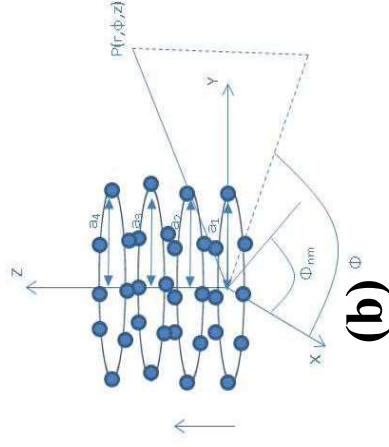
**Randomly distributed antennas**



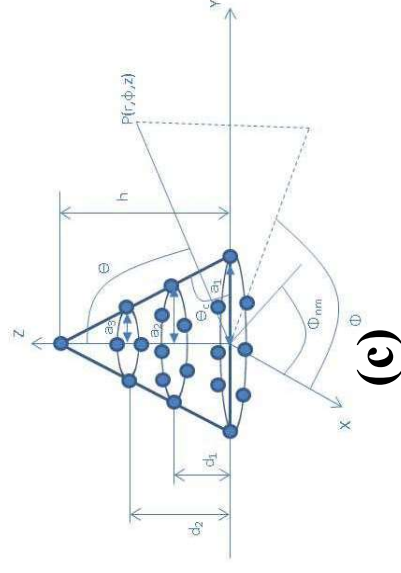
**Alaska Radar**



**Regular 3D and conformal antenna arrays topologies (a)**



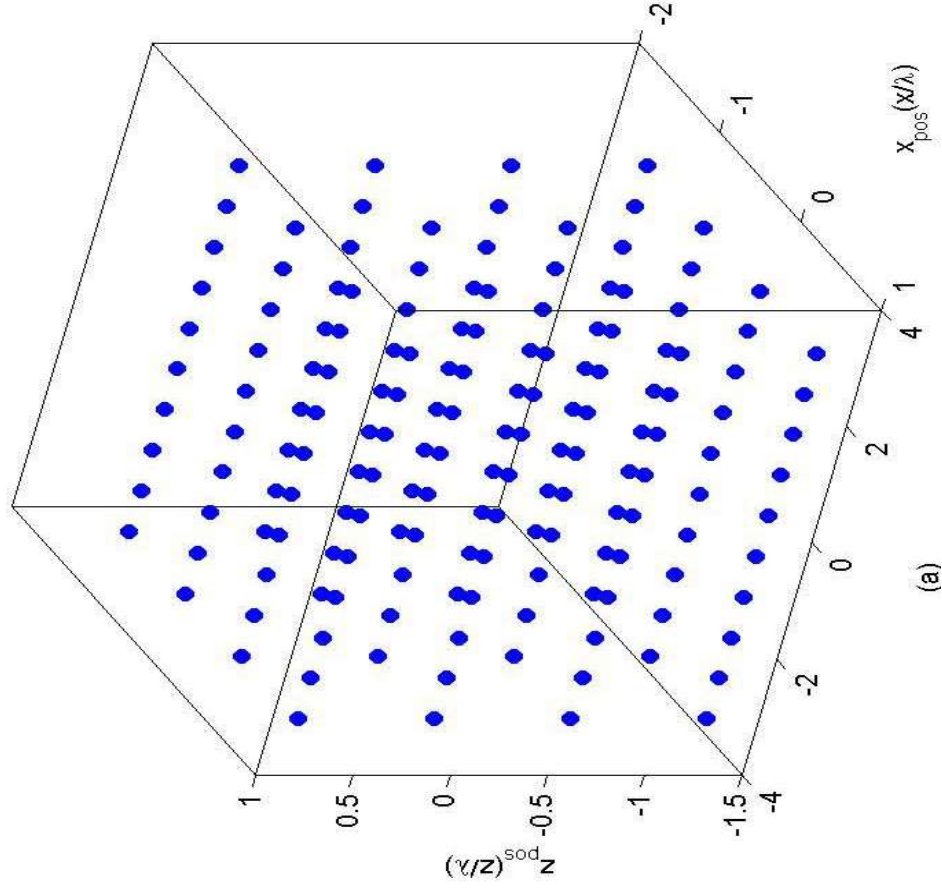
**(b) Cylindrical array (c) Conical array**



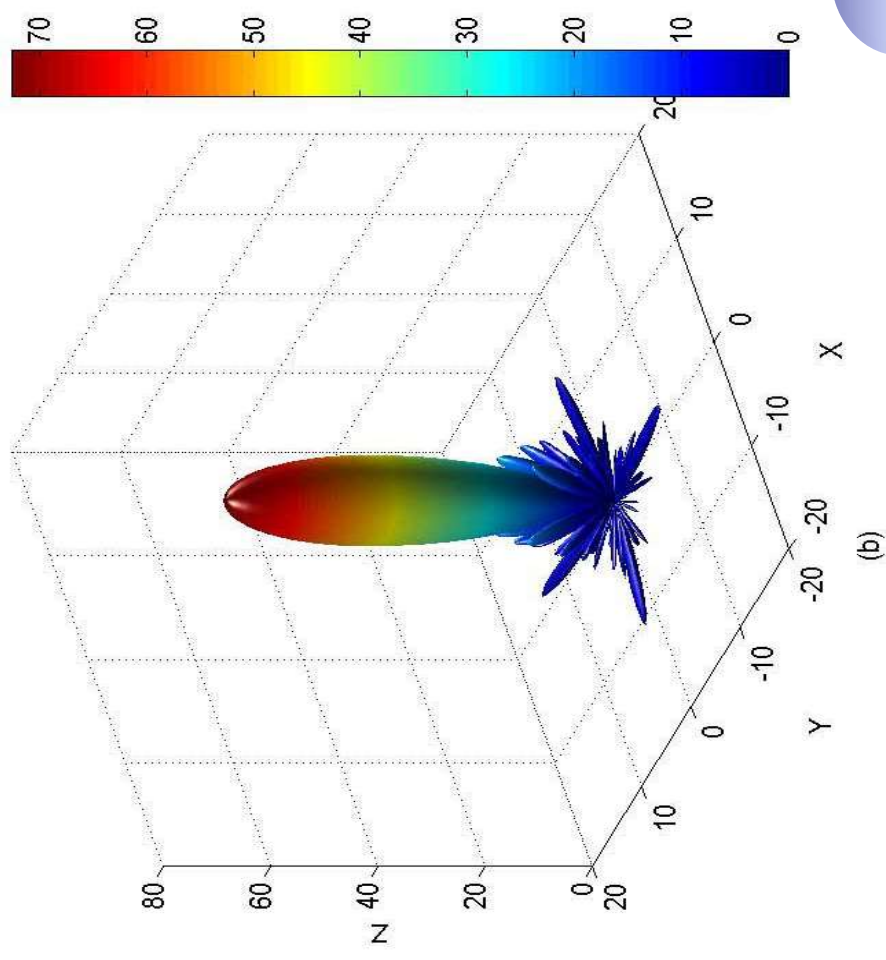
**Regular 3D and conformal antenna arrays topologies (a) Cubic array (b) Cylindrical array (c) Conical array**

# Geometries and Array Factor Formulation

(3-D) Three-dimensional array antennas: elements arranged in a cubic grid

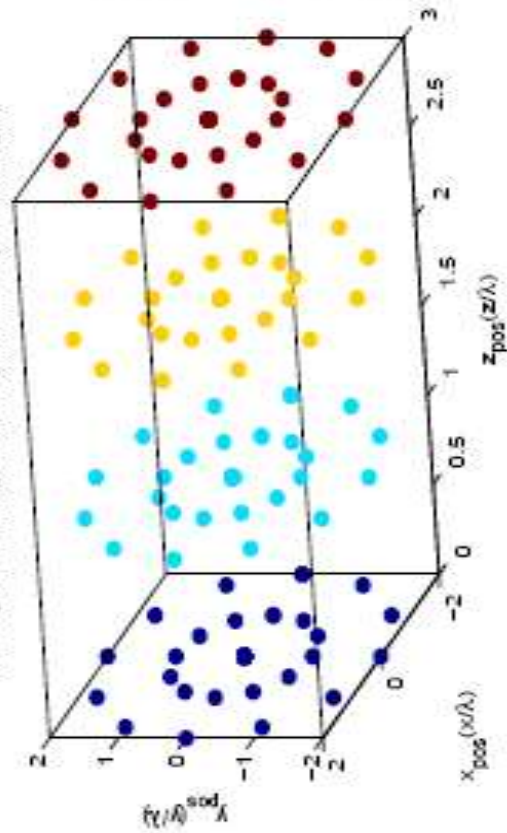


3-D Radiation pattern for a three-dimensional array antennas arranged in a cubic grid using:  $N_x = N_y = N_z = 4$  elements,  $N_x = 10$  elements,  $d_x = d_y = d_z = 0.7\lambda$



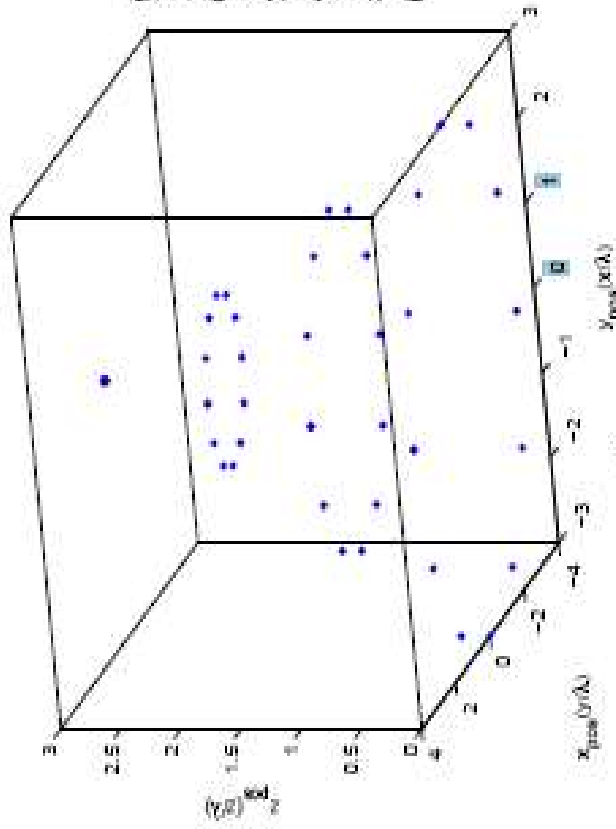


(3-D) Three-dimensional array antennas: elements arranged in a fully coated cylinder antenna grid

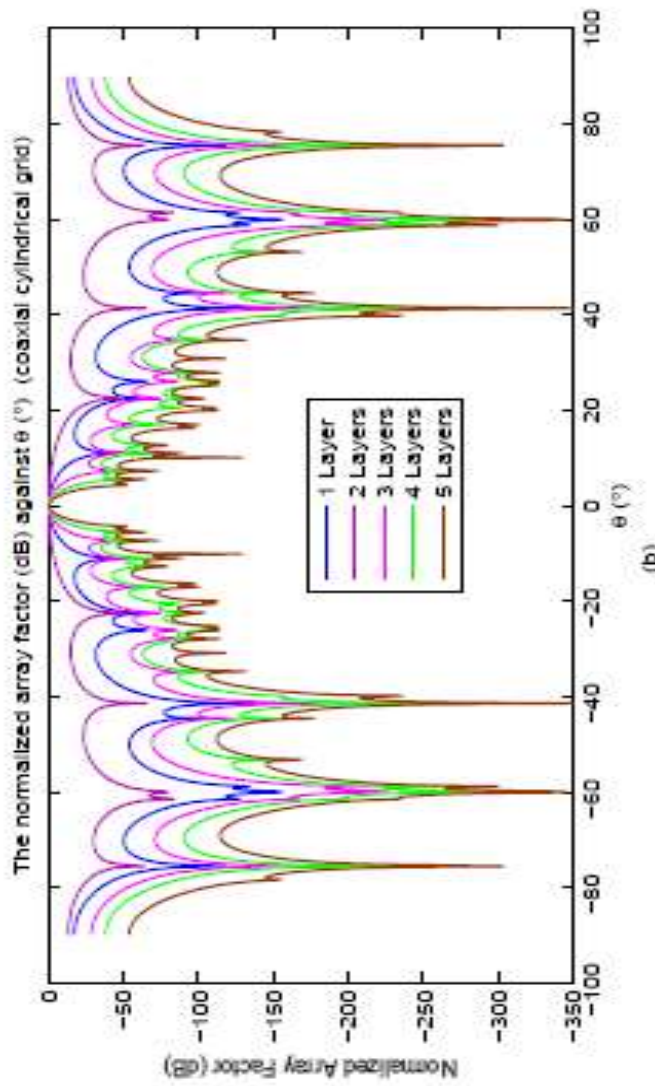


(a)

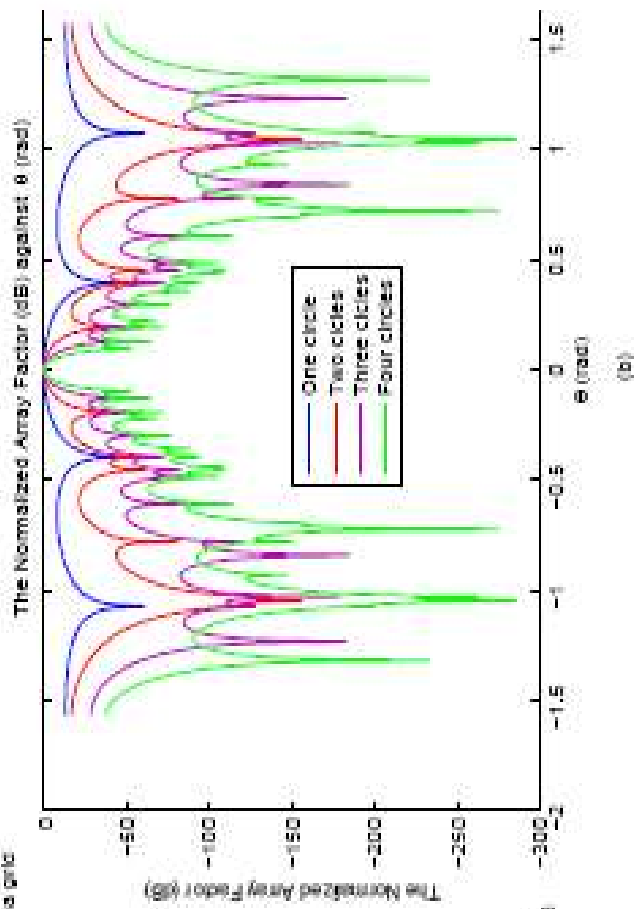
(3-D) Three-dimensional array antennas: elements arranged in conical antenna grid



(b)

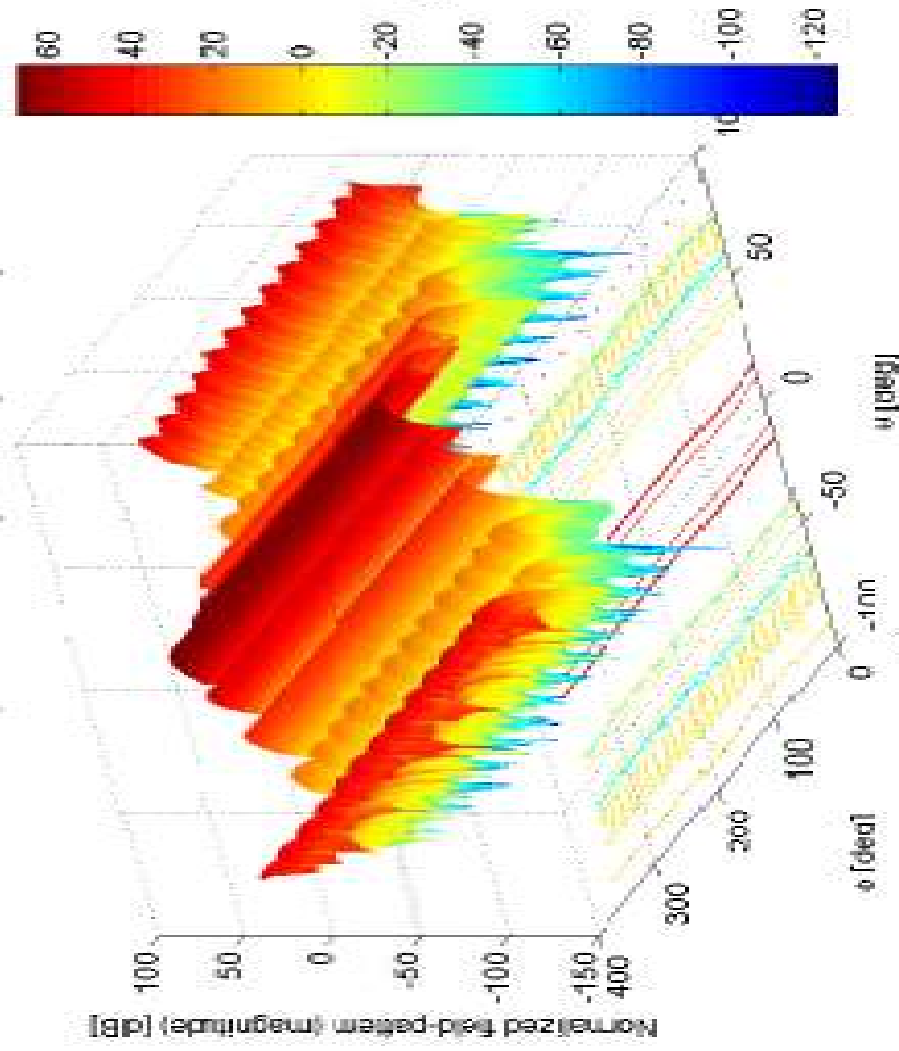


(b)



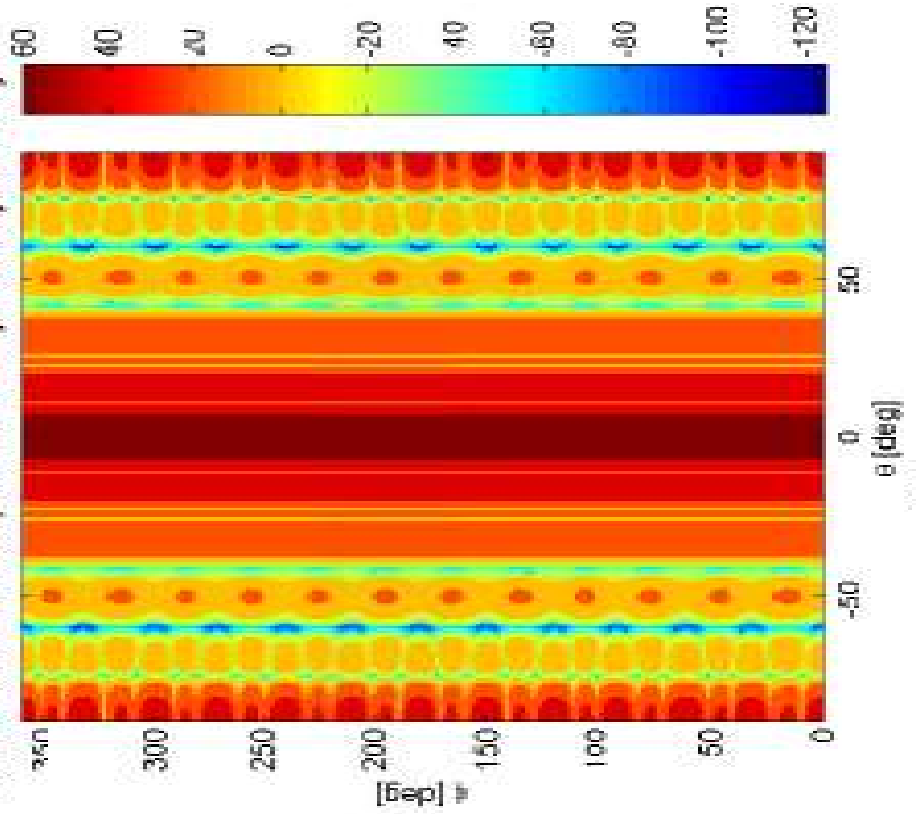
(b)

Radiation pattern of the fully coated cylinder array



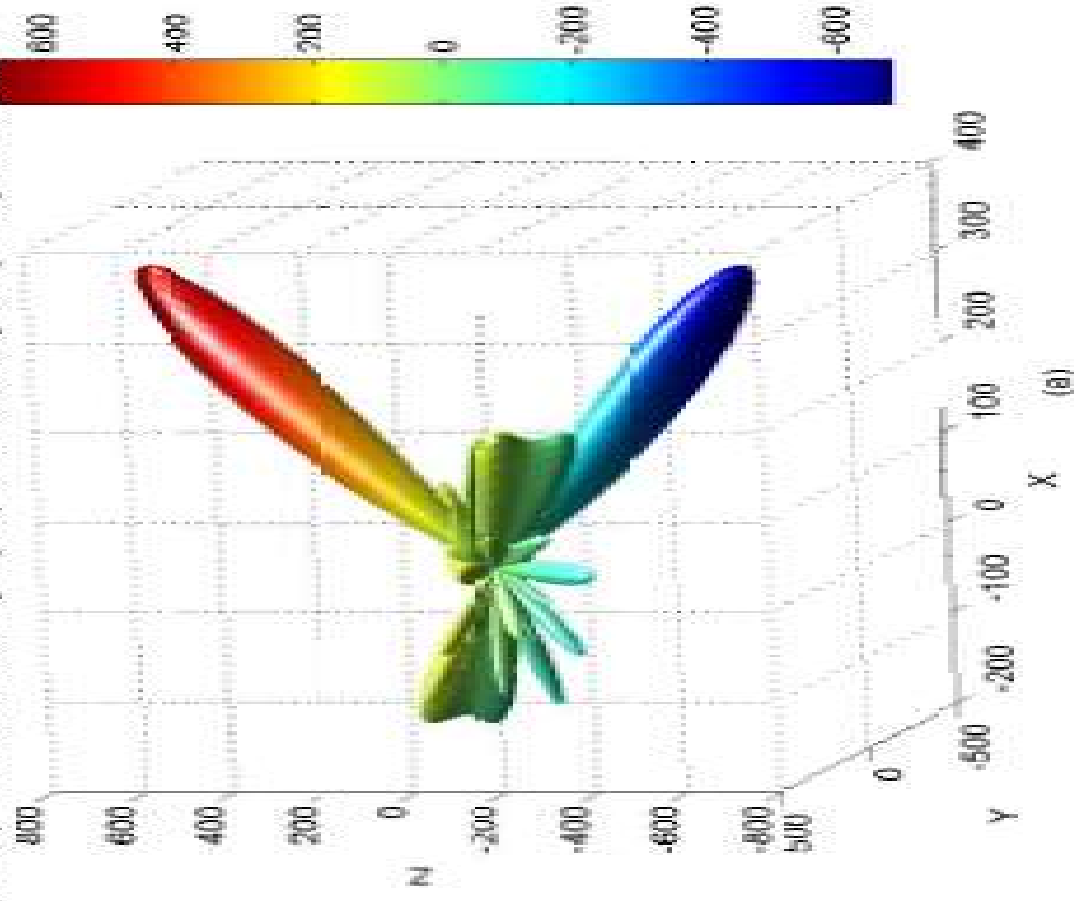
(a)

Contourf of the radiation pattern in the fully coated cylinder array

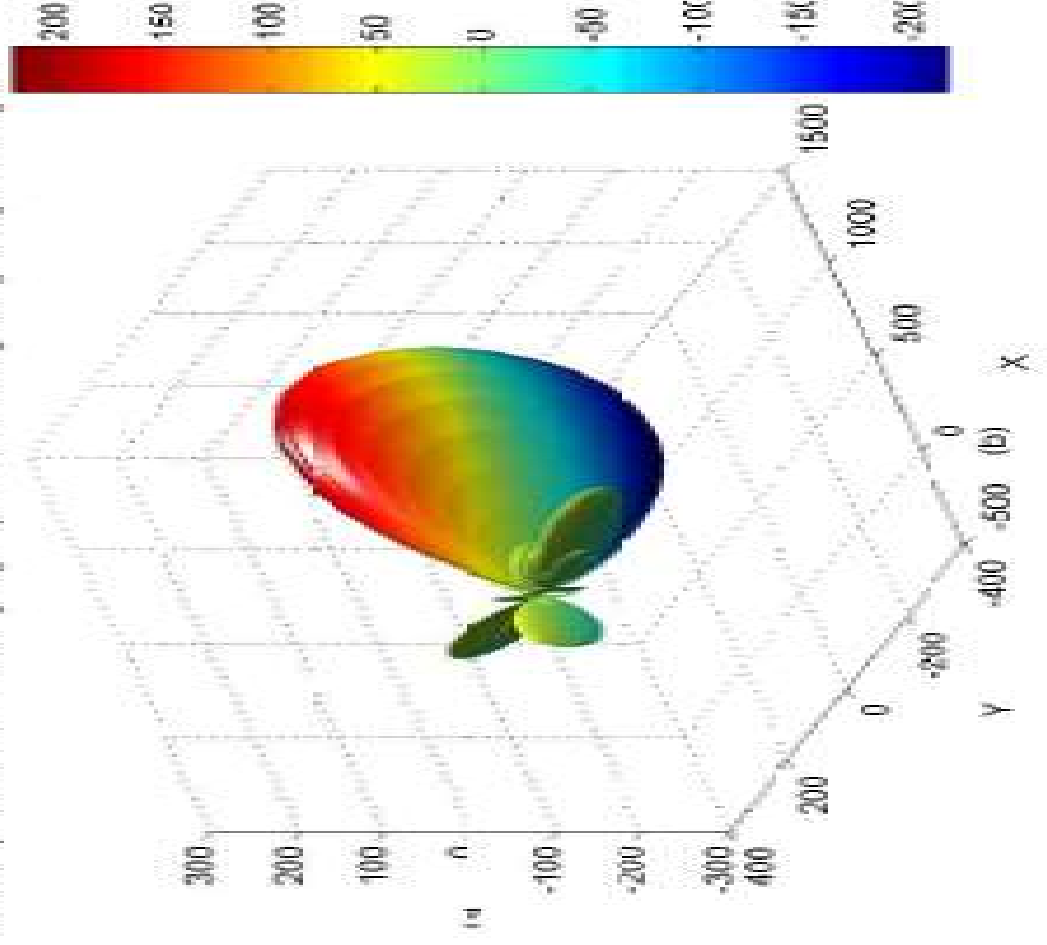


(b)

3-D Radiation pattern for a three-dimensional array antennas arranged in a conical grid, using:  $N_1=1$  central element,  $N_2=N_3=N_4=30$  and  $\theta_0=30^\circ$ ,  $R_1=R_2=R_3=R_4=2\lambda$ ,  $\phi_0=0$  and  $\theta_0=30^\circ$

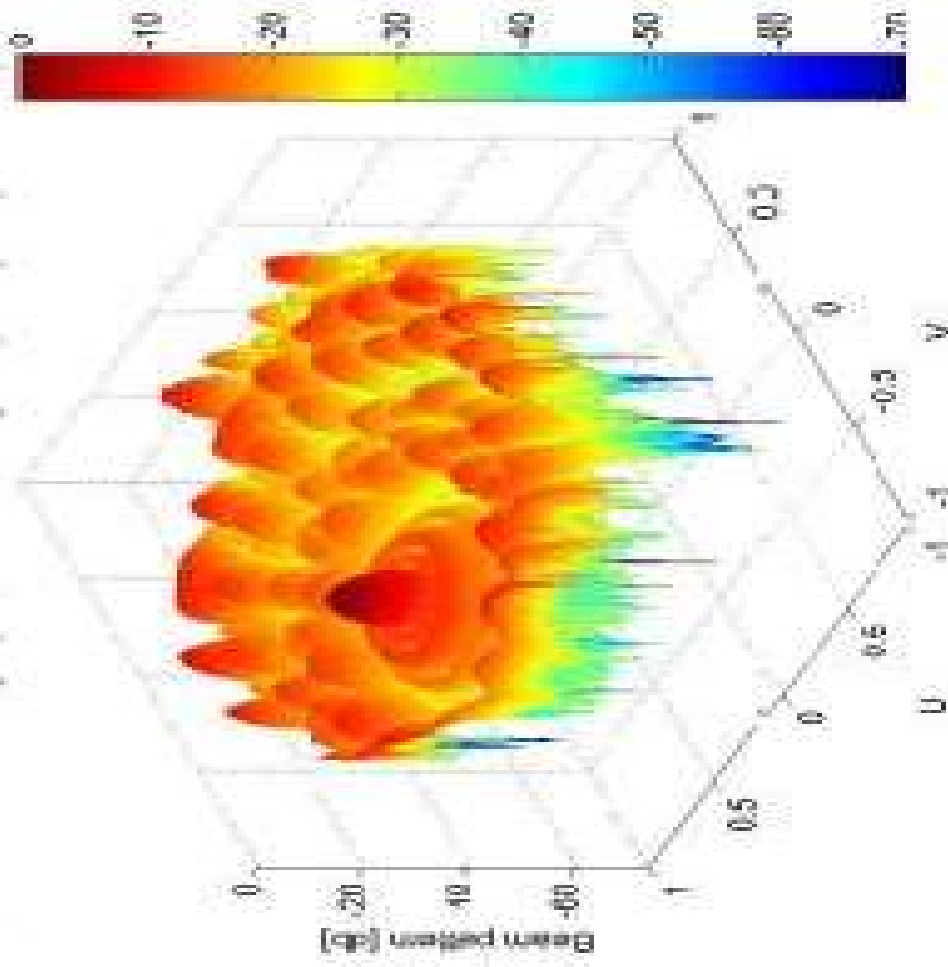


3-D Radiation pattern for a three-dimensional array antennas arranged in a conical grid using:  $N_1=1$  central element,  $N_2=N_3=N_4=12$  elements,  $R_1=R_2=R_3=R_4=2\lambda$ ,  $\phi_0=0$  and  $\theta_0=30^\circ$

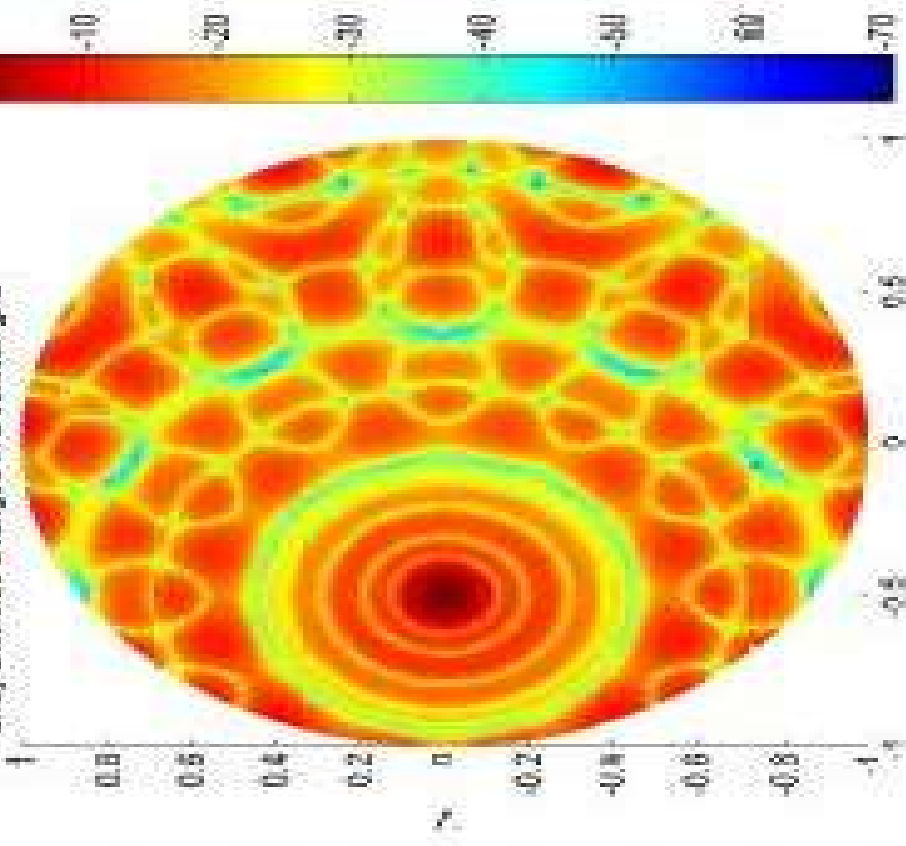




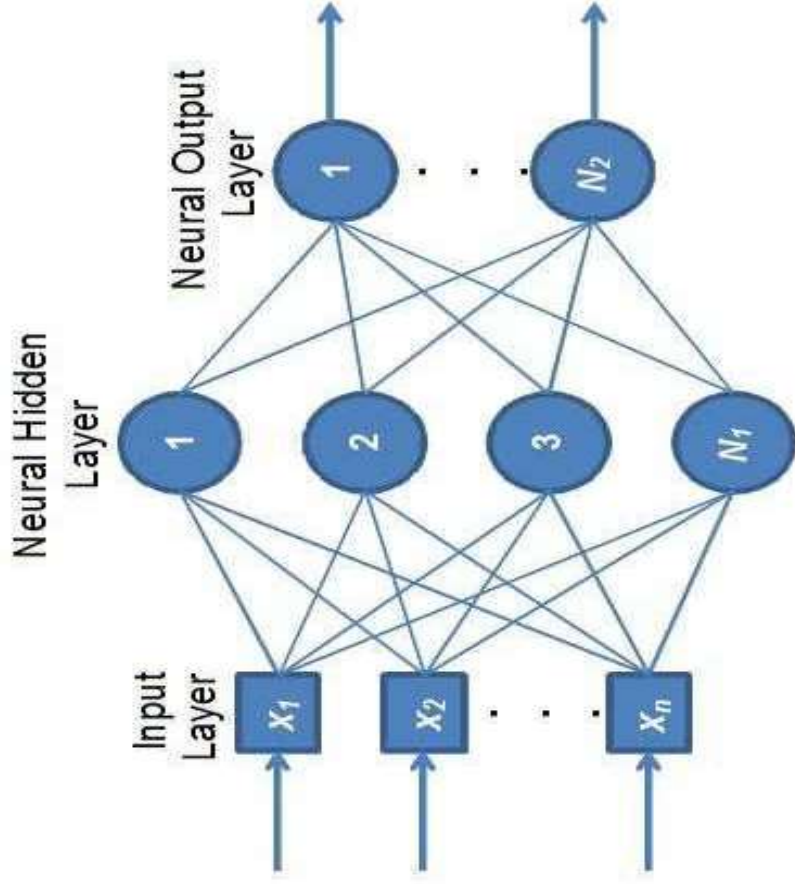
The Beam pattern in (db) for a three-dimensional array antennas arranged in a conical grid using  $N_x=1$  central element,  $N_y=N_z=N_x=12$  elements,  $R_x=1$ ,  $R_y=2$ ,  $R_z=3$ ,  $\theta_0=30^\circ$  and  $\phi_0=180^\circ$ .



Contourf of the beam pattern in (db) for a three-dimensional array antennas arranged in a conical grid



# Artificial Neural Networks (ANN) Principle

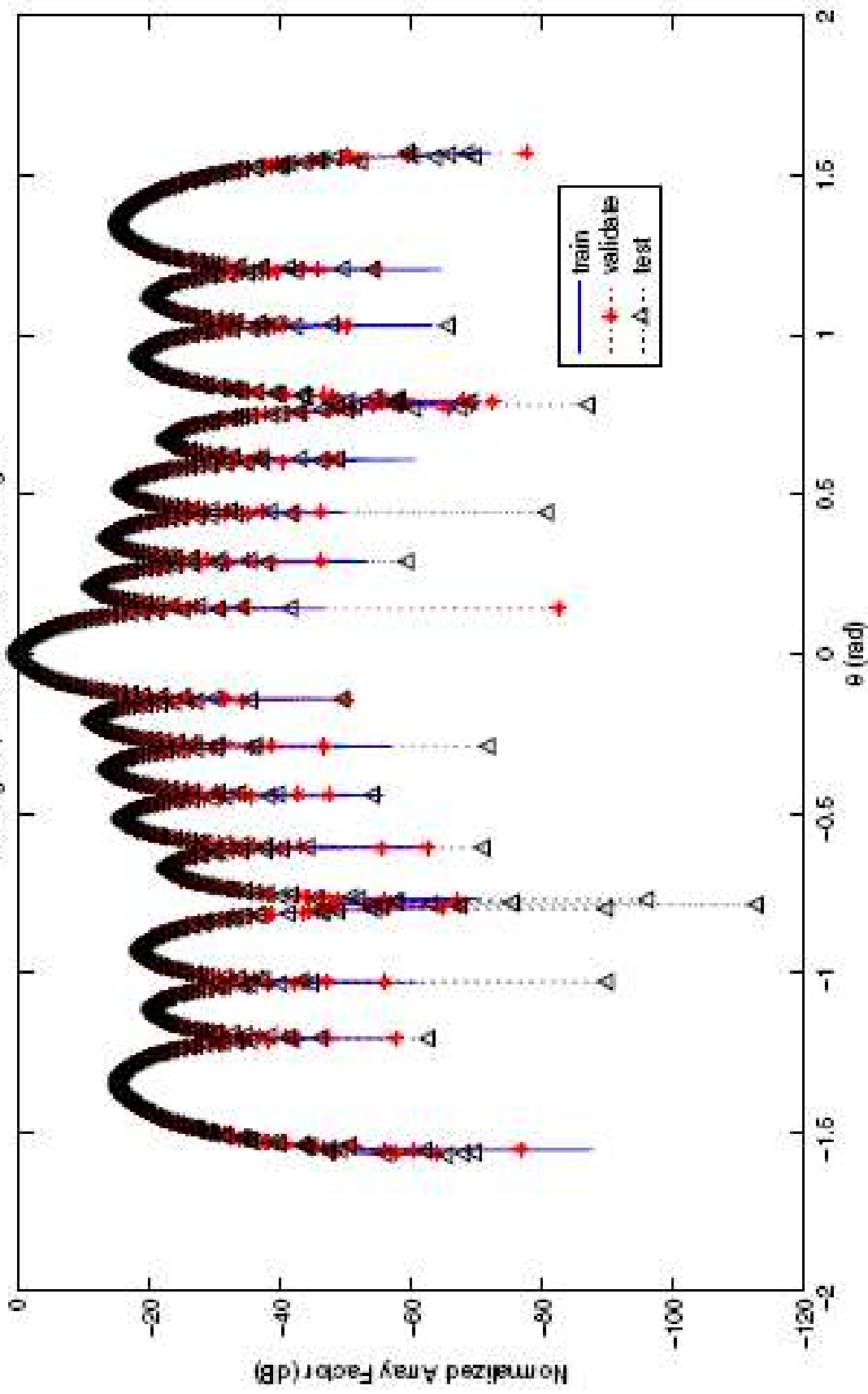


**ANN architecture**

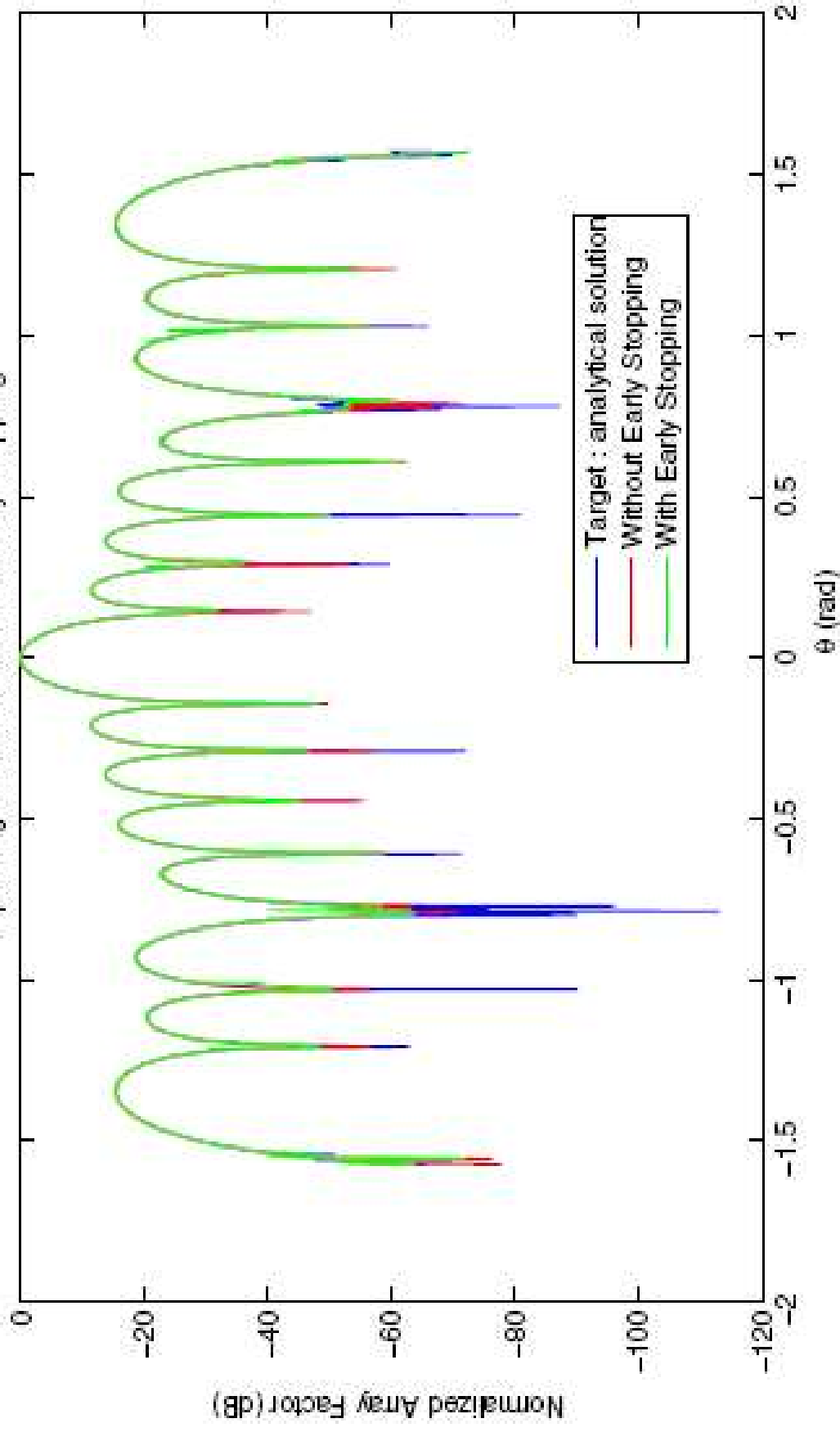
ARTIFICIAL NEURAL NETWORK (ANN) TRAINING PARAMETERS

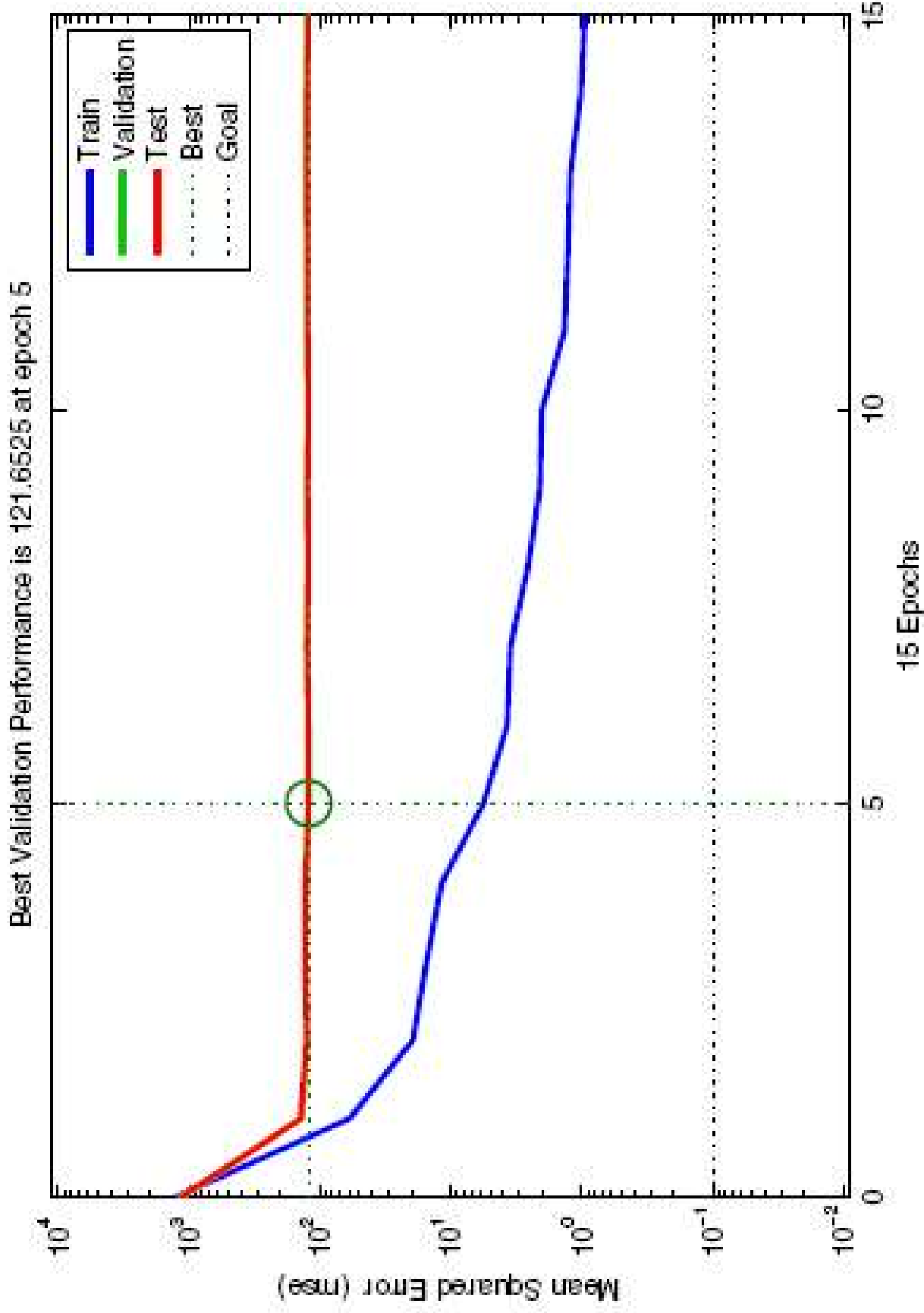
Number of input neurons	400
Number of hidden layers	2
Number of output neurons	1
Algorithm	lm
Learning rate	0.01
Momentum	0.95
MSE goal	$1e^0$
Minimum performance gradient	$1e^{-5}$
Initial mu	0.001
mu decrease factor	0.1
mu increase factor	10
Maximum mu	$1e^{10}$
Epochs between displays	25
Generate command-line output	false
Show training GUI	true
Maximum time to train in seconds	inf
Maximum number of epochs	300
Regularization parameter	0.8
Transfer function in hidden layer	tan-sigmoid ("tansig")
Transfer function in output layer	linear("purelin")

The Normalized Array Factor is data divided into three subsets:  
Training set, Validation set and Testing set



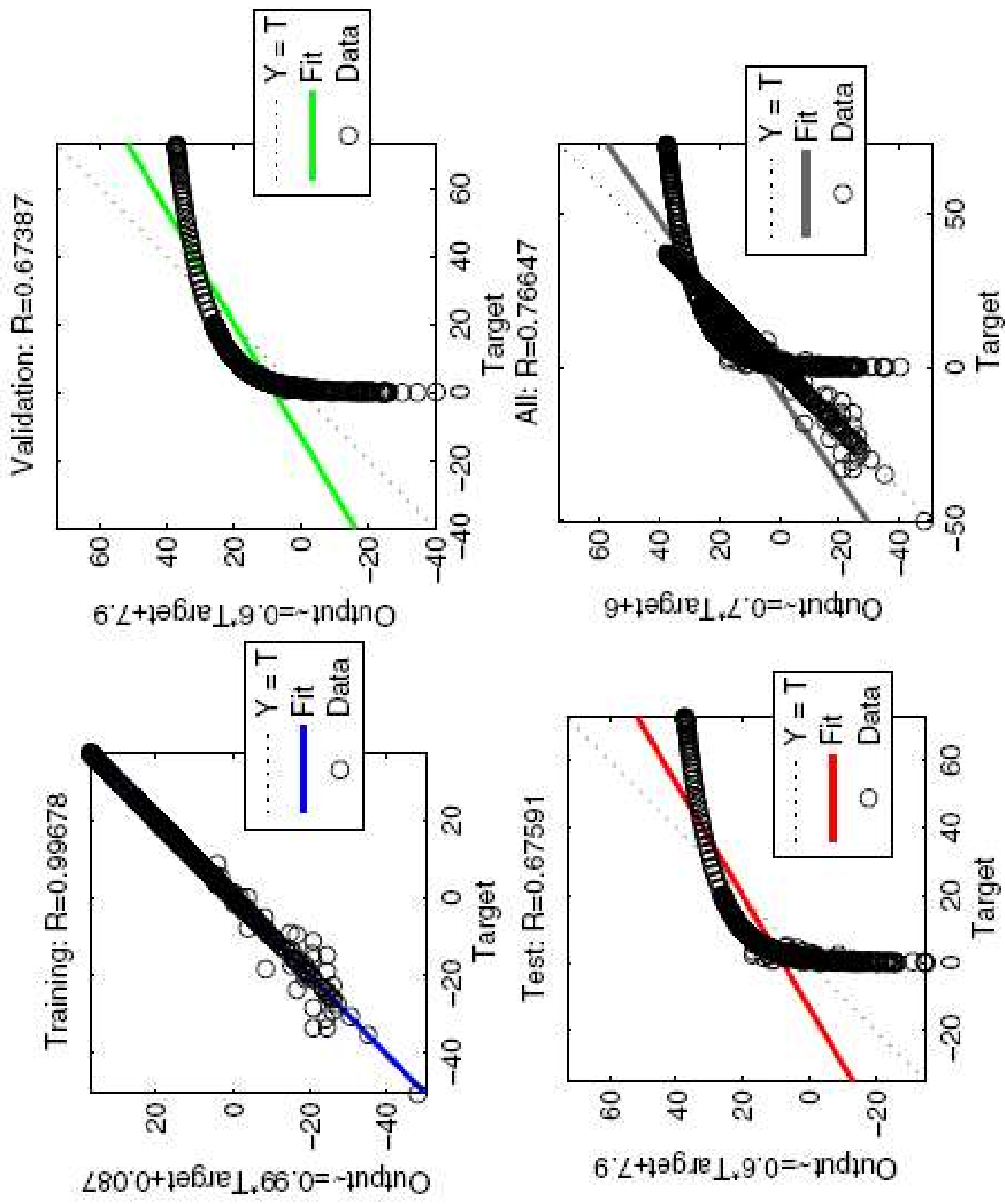
The Normalized Array Factor Function Approximation with Early Stopping:  
Improving Generalization with Early Stopping





Mean squared error (mse)





# Regression plot

# Conclusion

In this paper, we considered the steering array pattern synthesis of regular 3D and conformal phased arrays antenna using artificial neural network(ANN) adaptive beamforming algorithm. Several neural-network architectures has been simulated and tested with their effectiveness for array-pattern synthesis which has been compared. The results prove that MLP neural networks training model present a good performances matching to predict the desired radiation. The proposed structures are used in many applications that require coverage over the full 360° of azimuth with little variation of Side Lobe Level (SLL) or bandwidths. This work is necessary starting point for future investigation of neural network solution for irregular antenna array synthesis.

# References

- [1] B. Hamdi, S. Limam, and T. Aguili *Artificial Neural Network (ANN) Approach for Synthesis and Optimization of (3D) Three-Dimensional Periodic Phased Array Antenna*, 2016 17<sup>th</sup> International Symposium on Antenna Technology and Applied Electromagnetics (ANTEM), Montréal, Canada, July 10-13, 2016.
- [2] B. Hamdi, S. Limam, and T. Aguili, *Uniform and Concentric Circular Antenna Arrays Synthesis for Smart Antenna Systems using Artificial Neural Network Algorithm*, "Progress In Electromagnetics Research B, 2016.
- [3] Hadia El-Henawy, Esmat Abdoul-Fattah, Magdy Gamal Mohamed Attala , and Alaa S. Hafez, *A New Conformal Conical Phased Array Antenna for Surveillance Radars*, International Journal of Scientific and Engineering Research, Volume 5, Issue 5, May-2014.
- [4] R. Ghayoula, N. Fadlallah, A. Gharsallah and M. Rammal , *Phase-only adaptive nulling with neural networks for antenna array synthesis*, IET Microw. Antennas Propag., 2009, Vol.3, Iss.1, pp. 154163.
- [5] N. Fadlallah, and L. Moustafa, *Application of Artificial Neural Networks System for Synthesis of Phased Cylindrical Arc Antenna Arrays*, International Journal of Communication Engineering and Technology. ISSN 2277-3150 Volume 4, Number 1 (2014), pp. 7-15,

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# Floquet Modal Analysis to Modelize and Study 1D and 2-D Planar Almost Periodic Structures in Finite and Infinite Extent with Coupled Motifs

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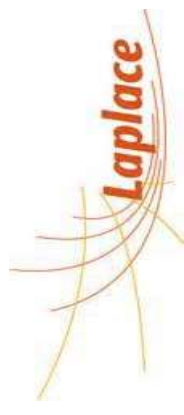
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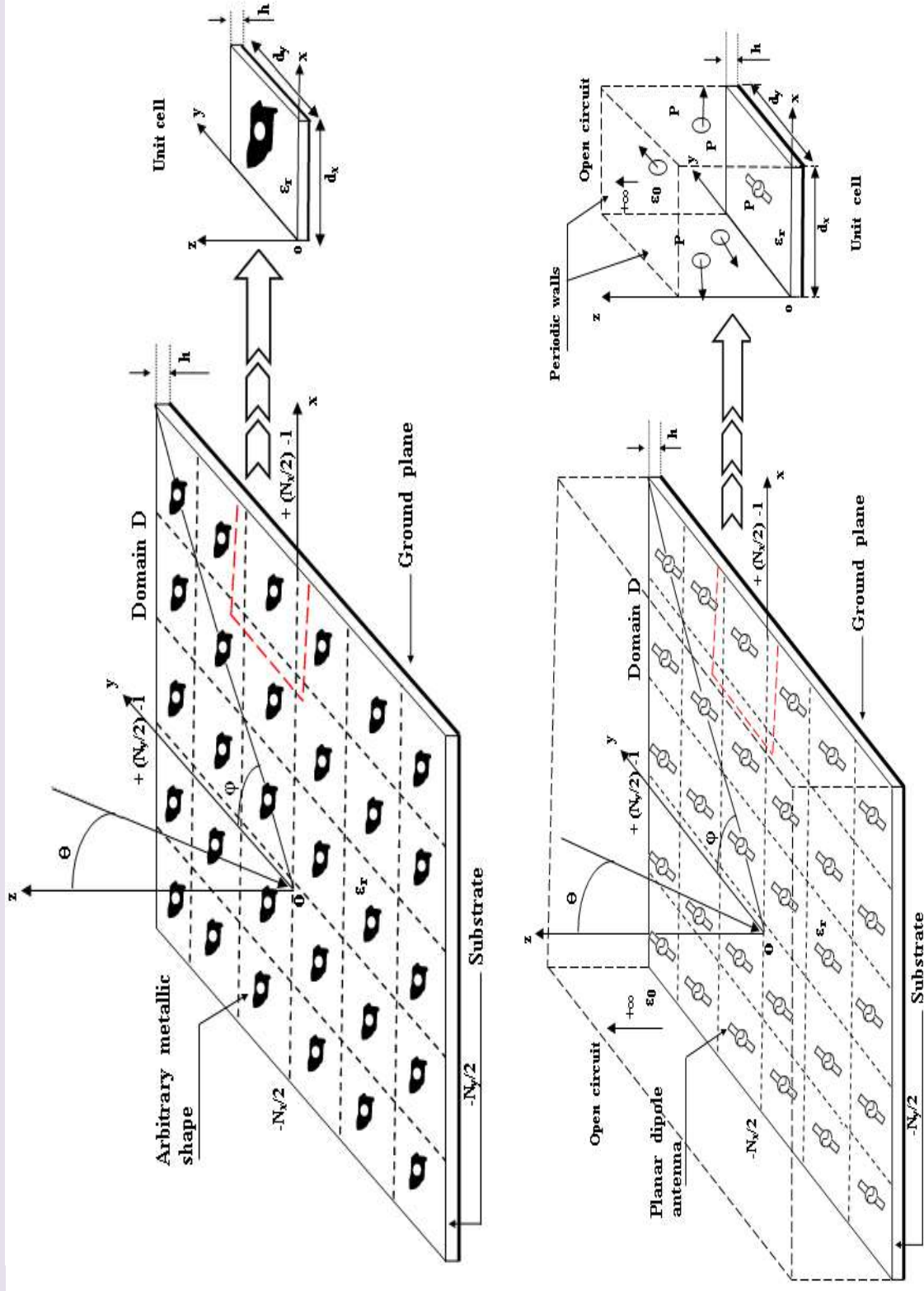


# Abstract

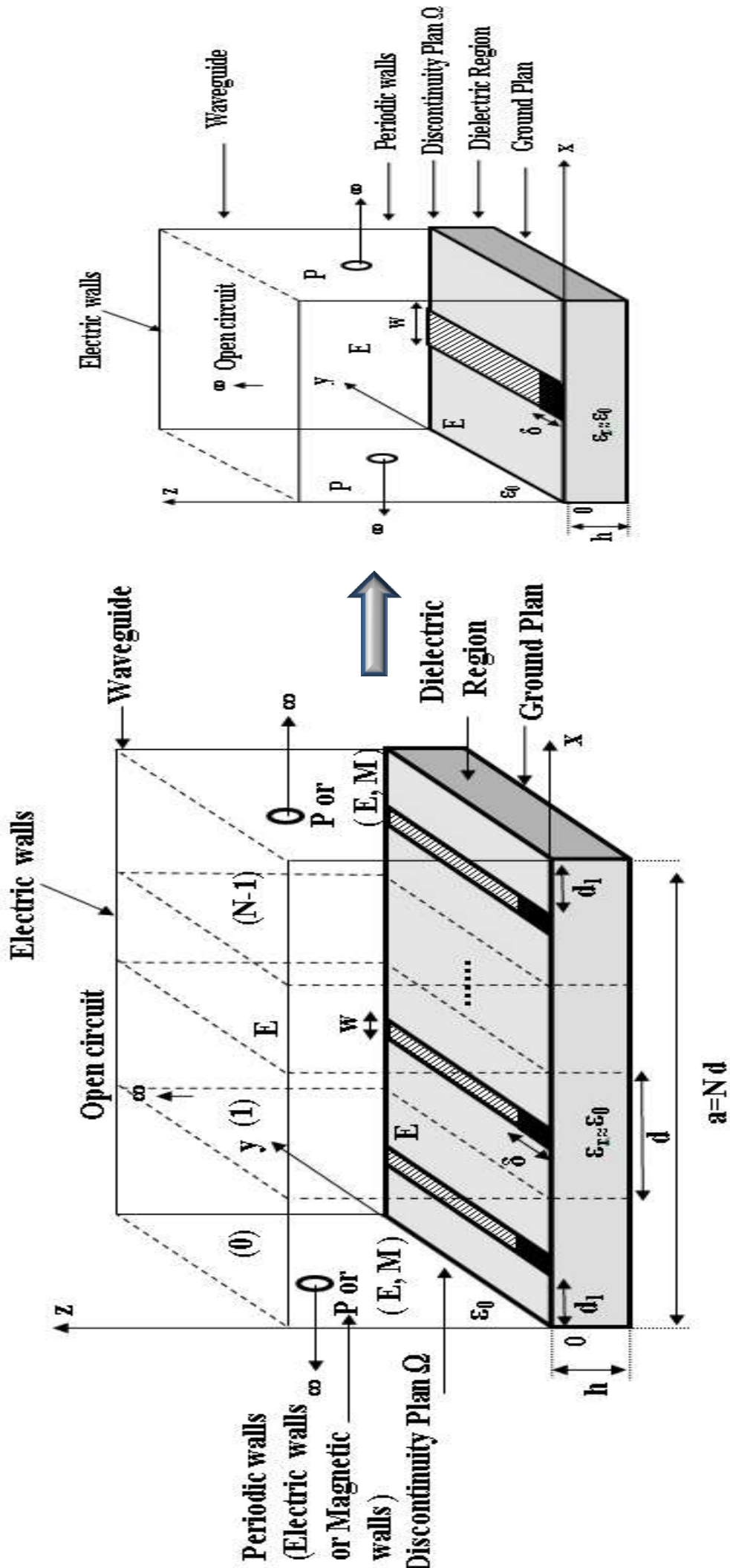
Studying of mutual coupling parameters between the antenna elements in an array environment has been considered as the subject of feature research. That is why, in this paper, we present a new Floquet modal analysis procedure for analyzing almost periodic structures. Accurate evaluation of the mutual coupling could be achieved by this analysis. It is shown how Floquet analysis can be exploited to study a finite array with arbitrary amplitude and linear phase distribution in both x-y directions including mutual coupling effects. Two different calculation methods of coupling coefficients between the array elements are presented, in spectral and spatial domains, to solve the suggested problem. For modeling the given structures, the moment method combined with Generalized Equivalent Circuit (MoM-GEC) is proposed. High gain in the running time and memory used is given using Floquet analysis. To validate this work, several examples are shown .



# Proposed structures

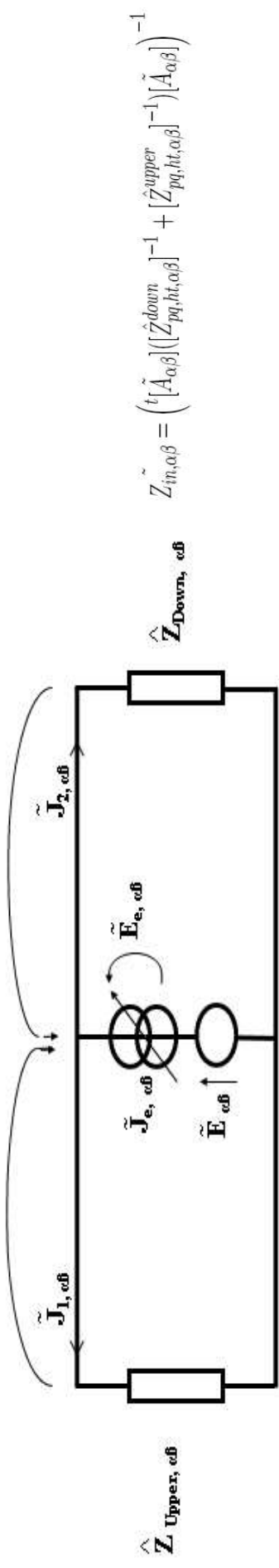


2-D Almost Periodic cells with arbitrary planar metallic shape (arbitrary motifs)



A section of 1-D almost periodic phased array micro-strip lines

# Proposed structures



$$\tilde{Z}_{in,\alpha\beta} = \left( {}^t[\tilde{A}_{\alpha\beta}]([\hat{Z}_{pq,ht,\alpha\beta}^{down}]^{-1} + [\hat{Z}_{pq,ht,\alpha\beta}^{upper}]^{-1})[\tilde{A}_{\alpha\beta}] \right)^{-1}$$

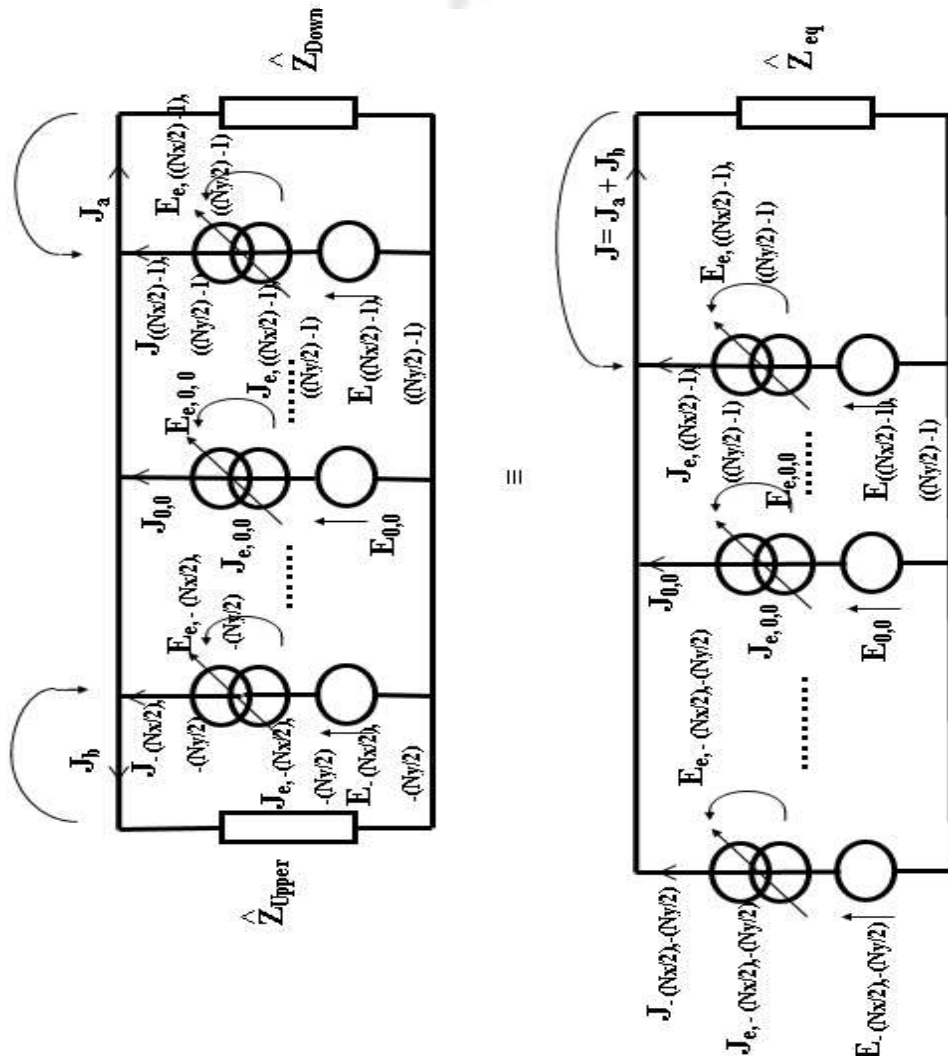
Floquet modal input impedance

$$\begin{cases} \tilde{J}_{\alpha\beta} = \tilde{J}_{e,\alpha\beta} \\ \tilde{E}_{e,\alpha\beta} = -\tilde{E}_{\alpha\beta} + \hat{Z}_{\alpha\beta} \tilde{J}_{e,\alpha\beta} \end{cases}$$



?? Boundaries conditions in term current and tension (kirchhoff laws) : basic element

Equivalent circuit for the global structure



Equivalent circuit for the global structure

$$[Z_{i,s}] = \left[ \frac{V_{i,t}}{I_{i,s}} \right] = \left( {}^t[A] \left( [\hat{Z}_{pq,ht}^{down}]^{-1} + [\hat{Z}_{pq,ht}^{upper}]^{-1} \right) [A] \right)^{-1}$$

Impedance matrix interaction



$$\begin{cases} J_{(i,s)} = J_{e,(i,s)} \\ E_{e,(i,s)} = -E_{i,s} + \hat{Z}J \end{cases}$$

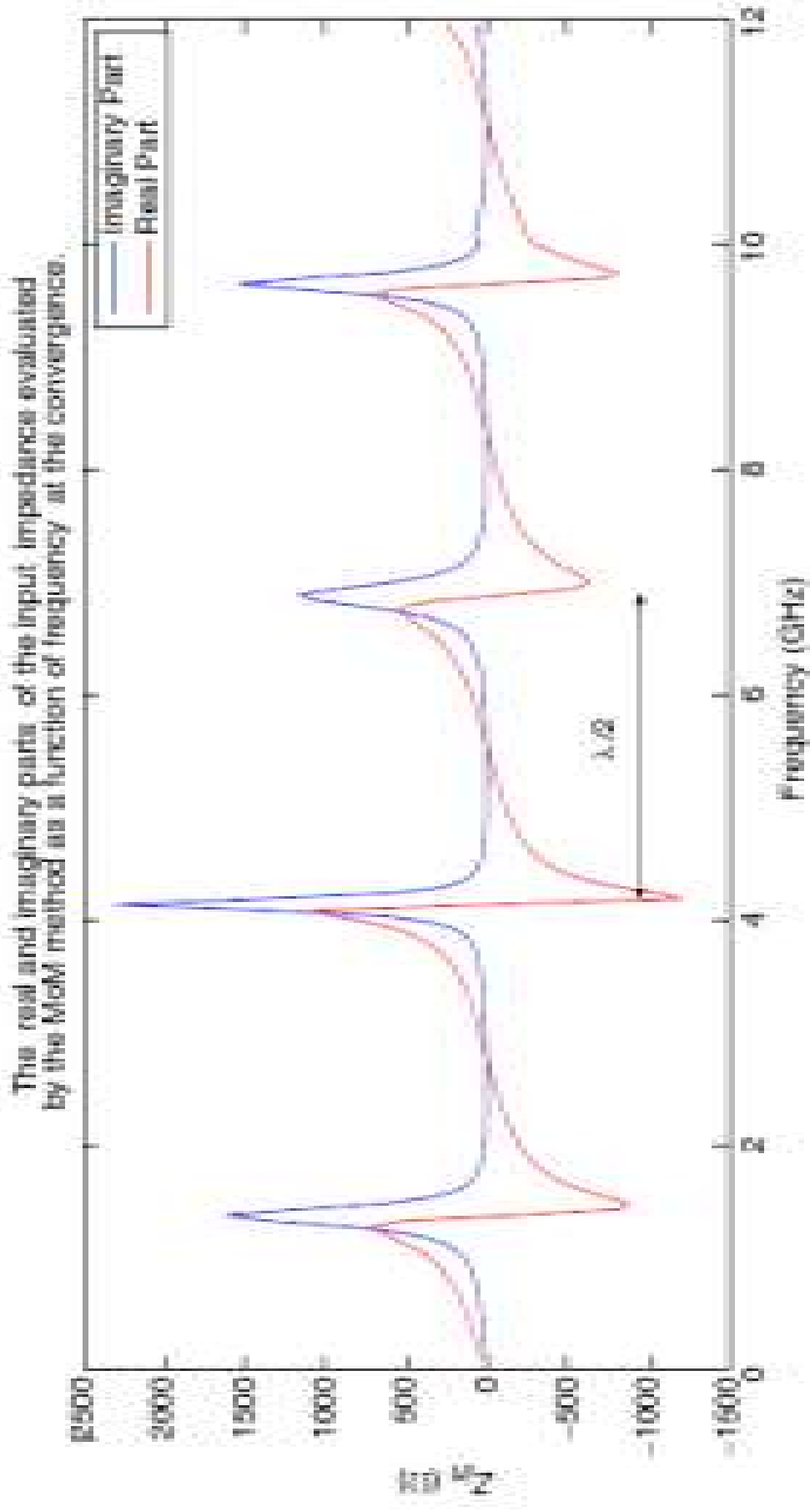
?? Boundaries conditions in term

current and tension (kirchhoff laws)  
: global structure

??Based on the modal calculation (Fourier Transform ) and the superposition theorem

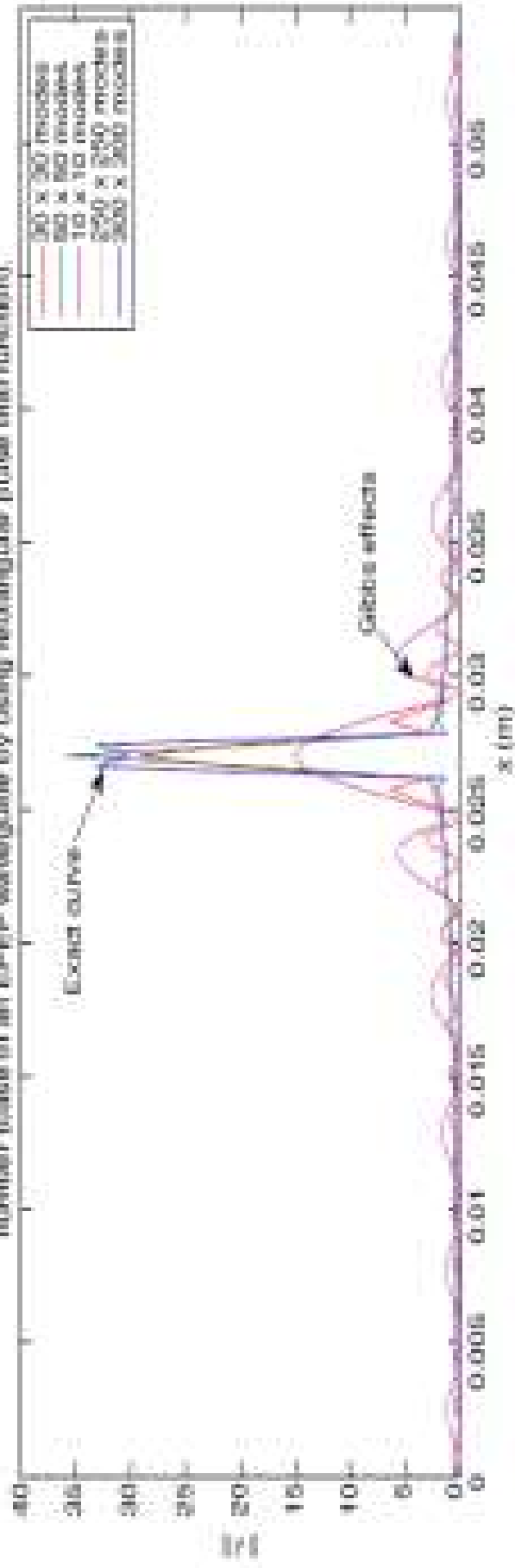
$$\begin{aligned} [Z_{i,s}] &= TF^{-1} [\hat{Z}_{\alpha_p, \beta_q}] TF \\ [Y_{i,s}] &= TF^{-1} [\hat{Y}_{\alpha_p, \beta_q}] TF \\ [S_{i,s}] &= TF^{-1} [\hat{S}_{\alpha_p, \beta_q}] TF \end{aligned}$$

# Numerical results: applications

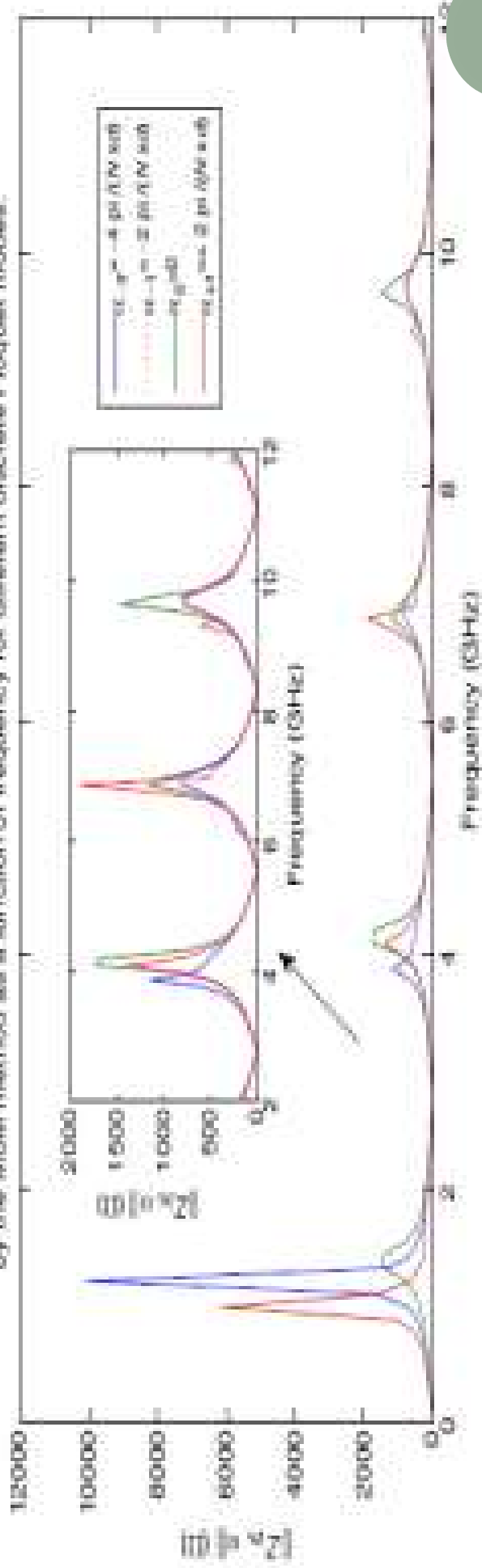




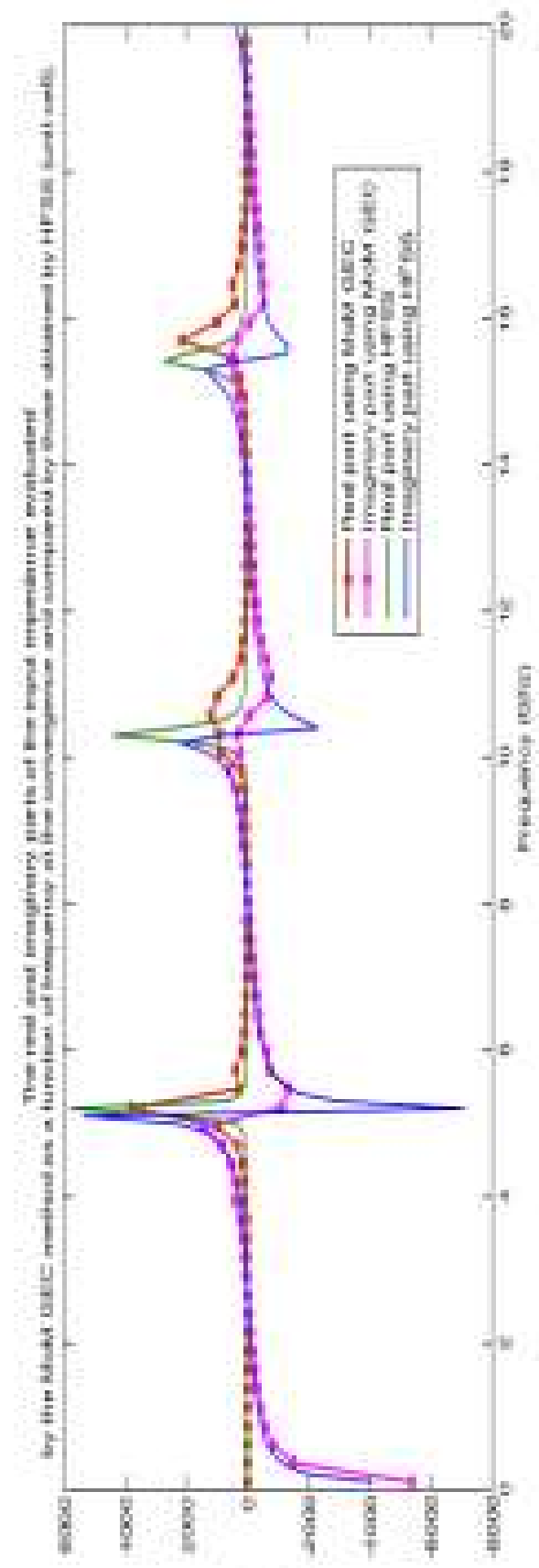
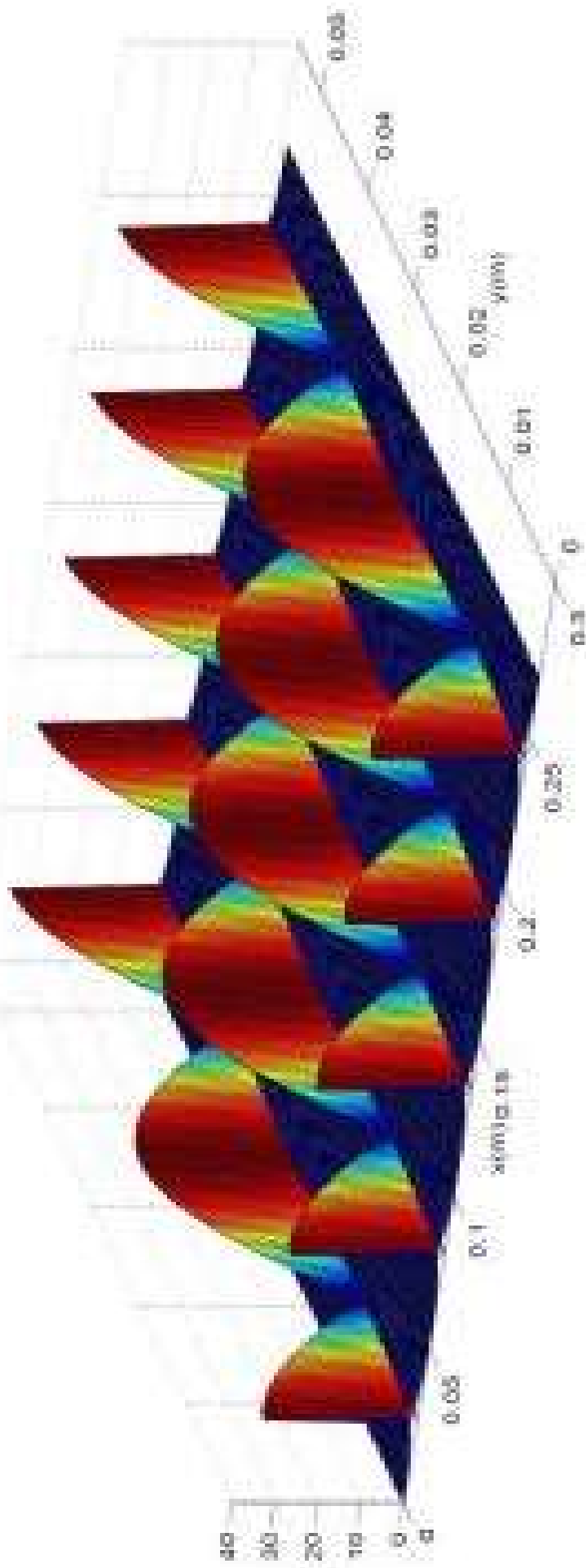
Numerical convergence of the current distribution evaluated by the MoM-DEC method as a function of modes number (case of an  $\text{E}_{\text{z}}$  waveguide by using rectangular pulse trial functions).



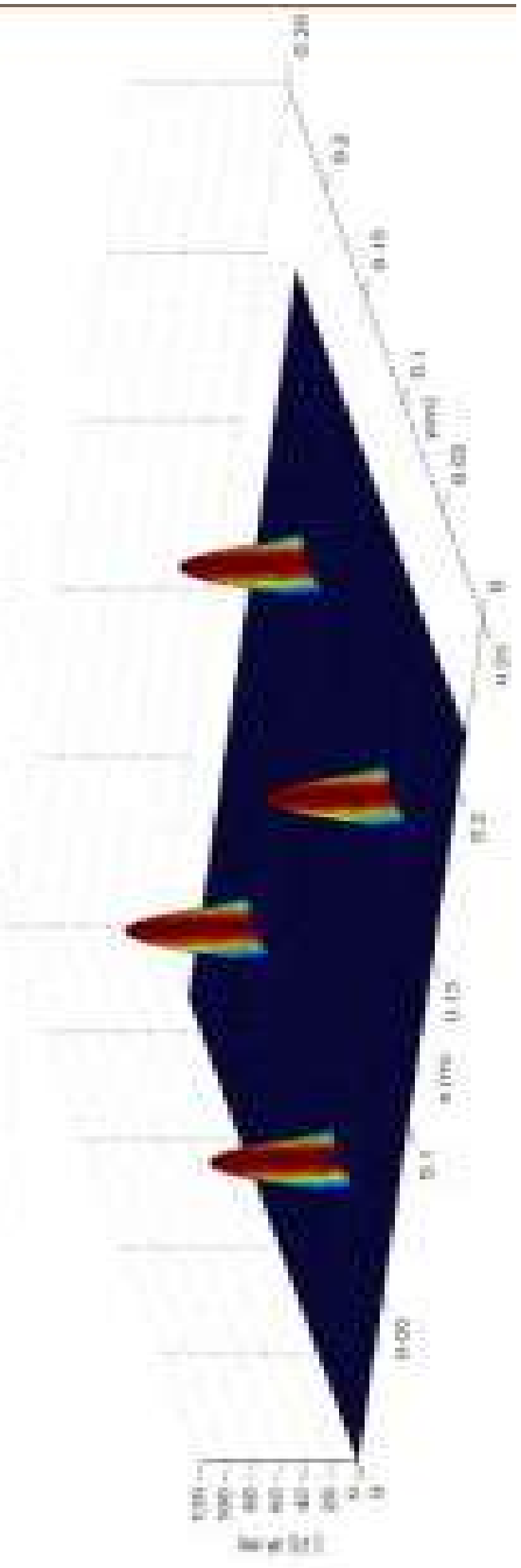
The magnitude part's numerical value of the input impedance evaluated by the MoM method as a function of frequency for different discrete Floquet modes.



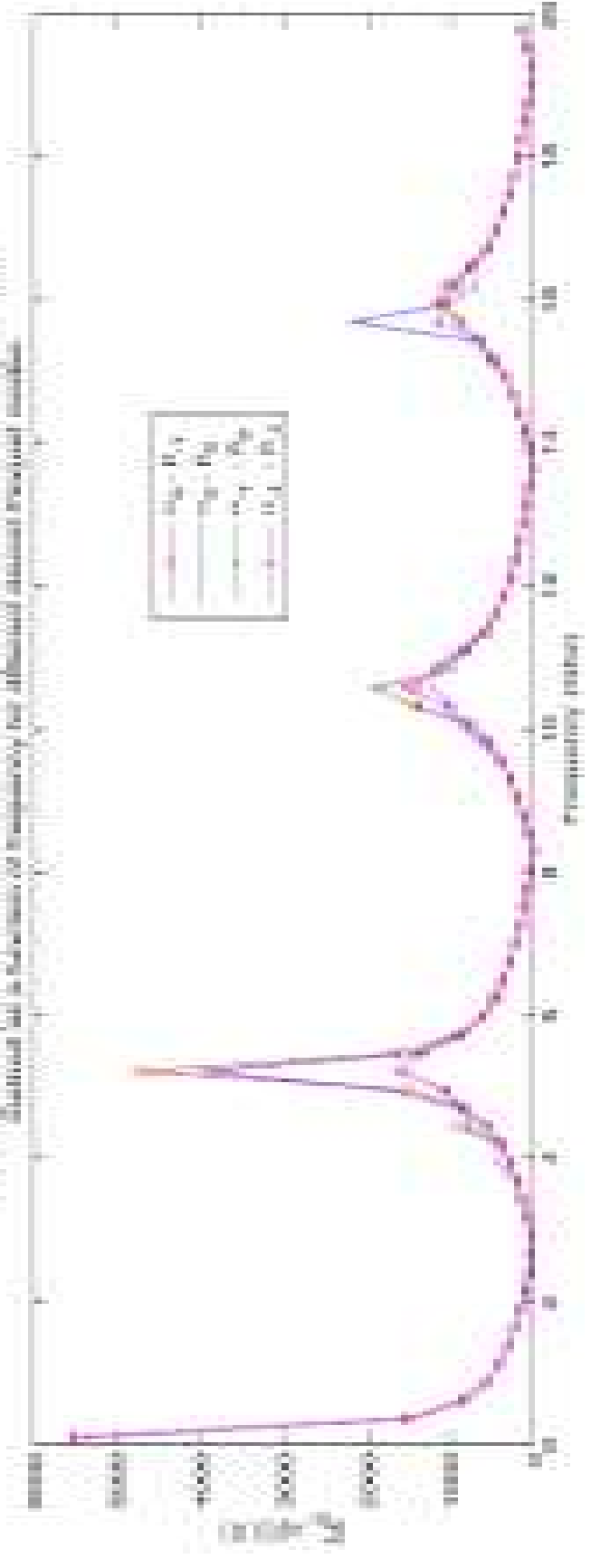
Distribution of the nuclear density for B-phased cross-slip array (obtained with basis functions (quite tedious) at full QMC and used here)



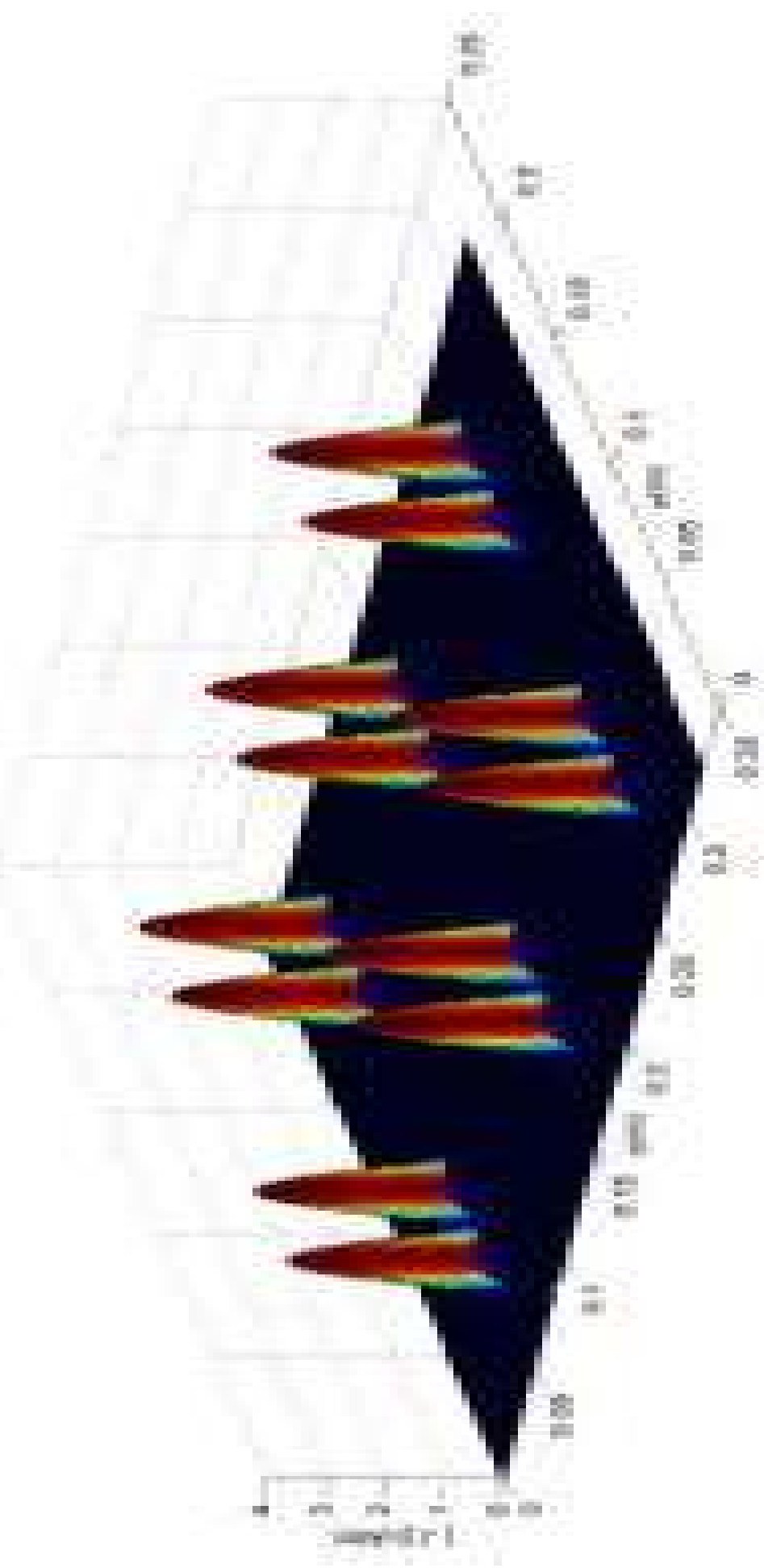
Evolution of the current density  $J_z$  in the  $xz$  plane (red) and the  $xy$  plane (blue) with the time coordinate (color is shown) at  $t = 0.2$  (left) and  $t = 0.4$  (right).



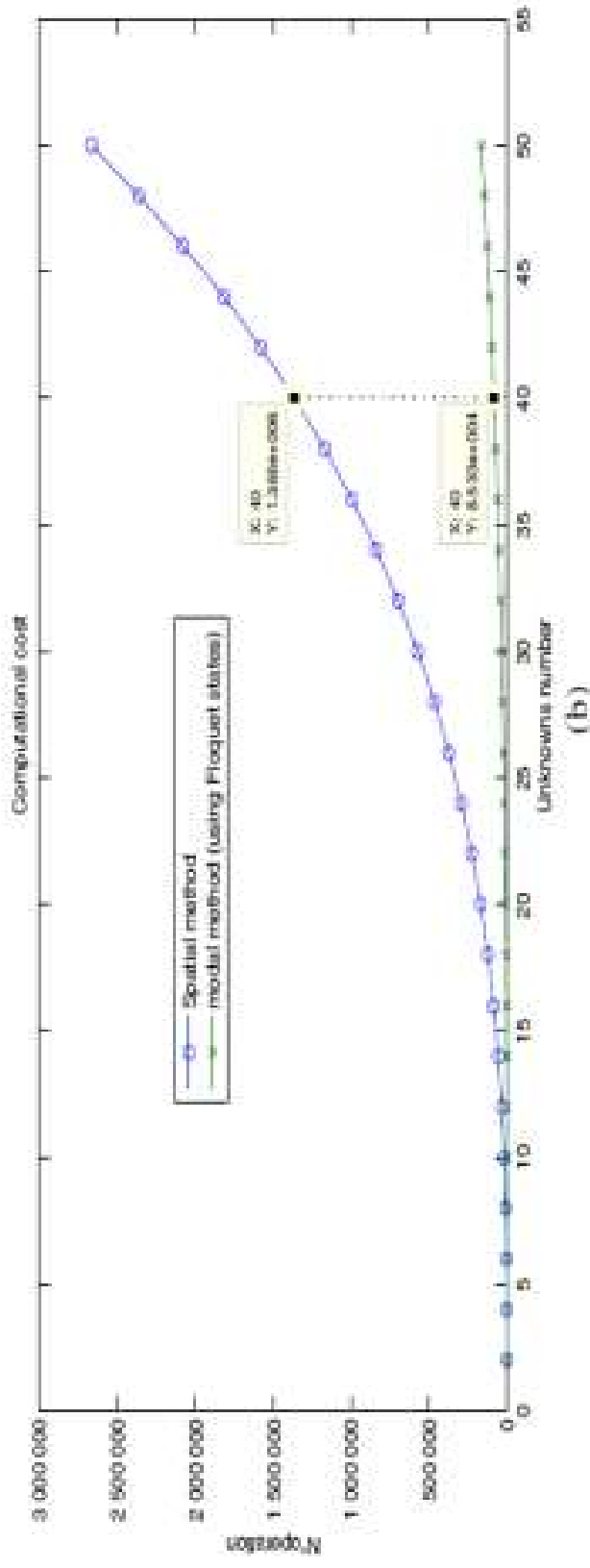
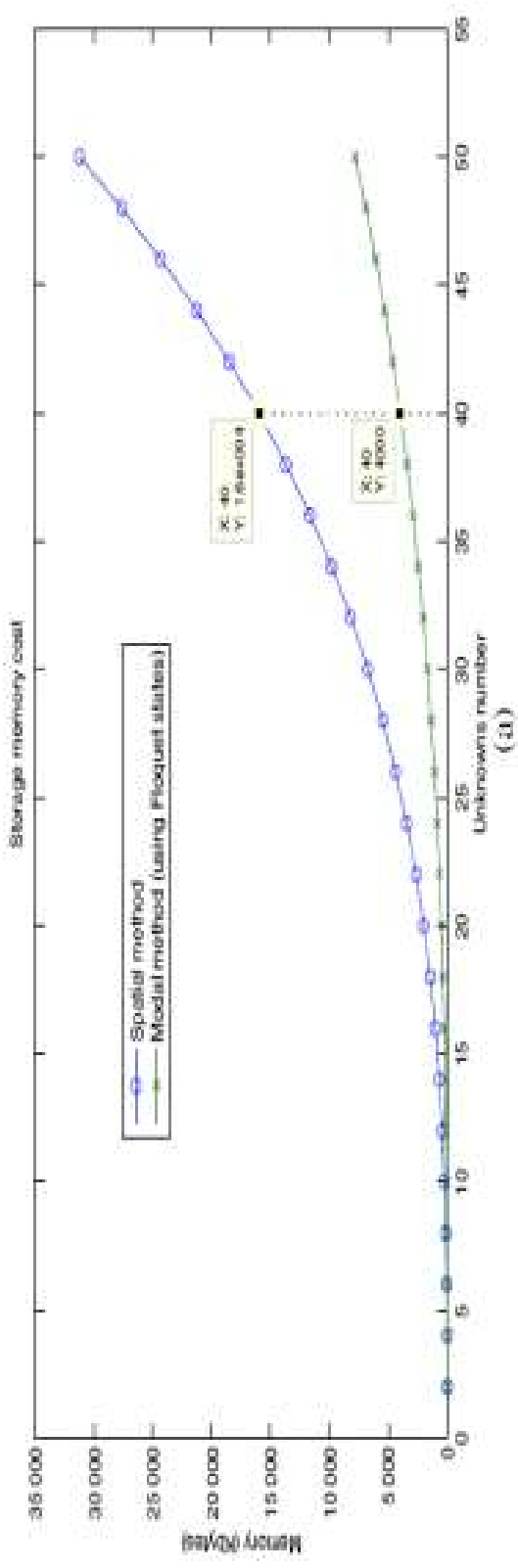
The magnitude and the direction of the total magnetic induction by the field (left) at  $t = 0.2$  and  $t = 0.4$  (right) for different initial profiles.



The following table shows the results of the experiment. The first column shows the number of the trial, the second column shows the number of trials, the third column shows the number of trials, the fourth column shows the number of trials, and the fifth column shows the number of trials.



# Storage memory and time consuming



# Conclusion

In this paper, we present a new modal approach for the fast and efficient calculation of mutual coupling in planar periodic structures. It is important to show that the modal decomposition to study and analyze finite and infinite periodic structures successfully removes the complexity of the proposed problem. For example, the employed formalism based on Floquet analysis reduces the electromagnetic calculation on one unit cell, in contrast to old methods to study the wave behavior of the whole structure. This allows an easier computation of the scattering matrix, by using a simple elegant Fourier Transformation. The essential advantage of this new modal analysis is reducing computing time and memory requirements which are roughly proportional to the square or cube of the number of array elements.

# References

- [1] B. Hamdi , T. Aguilí and H. Baudrand, Uni-dimensional planar almost periodic structures analysis to decompose central arbitrary located source in spectral domain,”IEEE-ANTEM 2012: 15th International Symposium of ANtenna Technology and applied ElectroMagnetics, Toulouse, France.
- [2] B. Hamdi, T. Aguilí , N. Raveu and H. Baudrand, Calculation of the Mutual Coupling Parameters and Their Effects in 1-D Planar Almost Periodic Structures ,” Progress In Electromagnetics Research B, 2014.
- [3] B. Hamdi, T. Aguilí , and H. Baudrand, Floquet Modal Analysis To Modelize and Study 2-D Planar Almost Periodic Structures In Finite And Infinite Extent With Coupled Motifs ,”Progress In Electromagnetics Research B, Vol. 62, pp. 63-86, 2015.
- [4] M. Ayari, T. Aguilí , H. Temimi and H. Baudrand, An Extended Version of Transverse Wave Approach (TWA) for Full-Wave Investigation of Planar Structures,” Journal of Microwaves, Optoelectronics and Electromagnetic Applications, Vol. 7, No. 2, December 2008.
- [5] Z. Mekkioui and H. Baudrand, 2-D bi-periodic centered-fed microstrip leaky-wave antenna (LWA) analysis by a source modal decomposition in spectral domain,” IET, 2009.